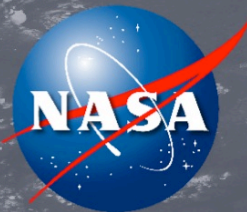


Evaluating the potential of chemical reanalysis products for air pollution exposure assessment

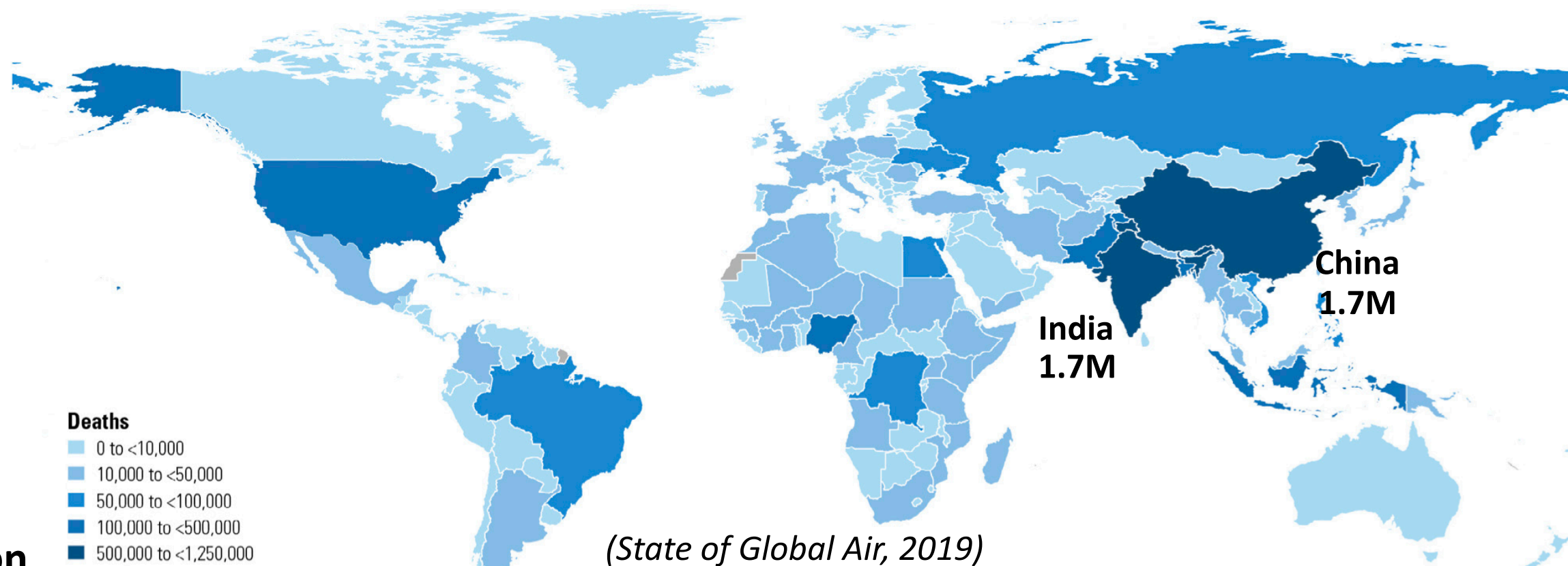
Kazuyuki Miyazaki, Kevin Bowman

Jet Propulsion Laboratory, California Institute of Technology



Long-term ozone exposure and mortality

Number of deaths attributable to air pollution (ambient PM2.5, household, and ozone) in 2017

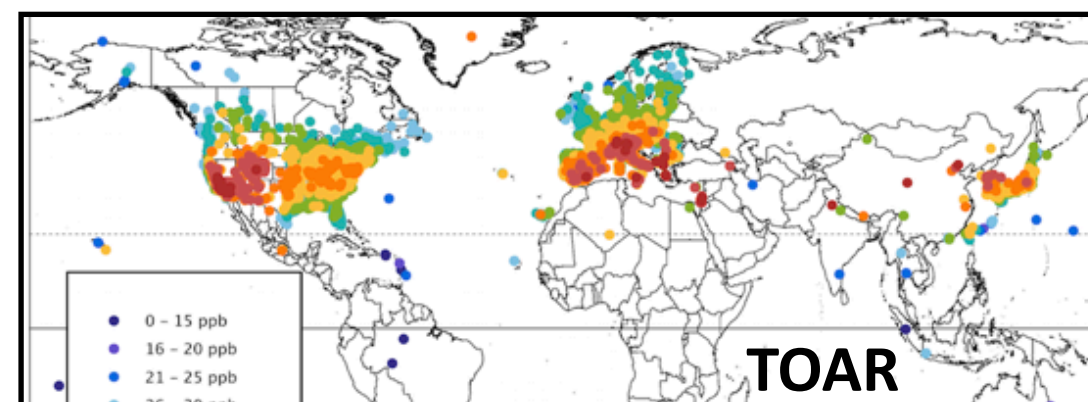


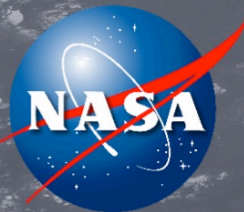
Air pollution

- is the fifth highest mortality risk factor globally and associated with about 4.9 million deaths (2017)
- reduced about 20 months of our life in average, with significant regional differences
- **Developing countries**: Increased emissions & stronger OPE → increasing risks

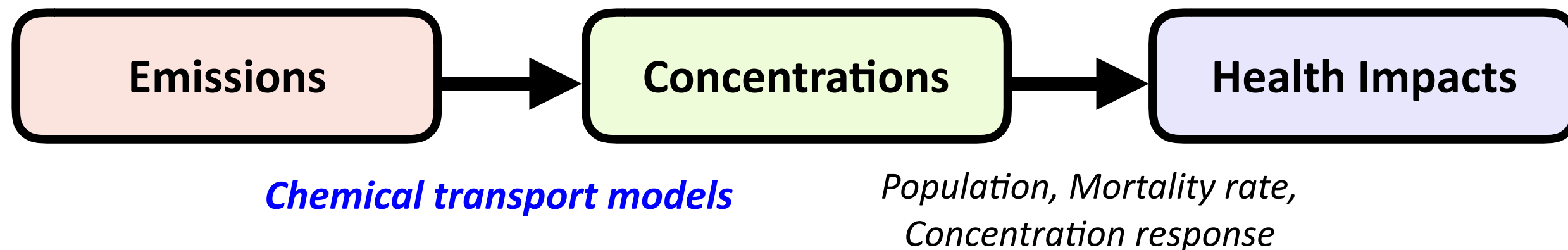
The in-situ observing network is clearly insufficient for global health impact assessment (Fleming et al., 2017; Seltzer et al., 2018 for US, Europe, and China)

*The regular surface ozone monitoring sites:
Roughly only 17% of the global population!*

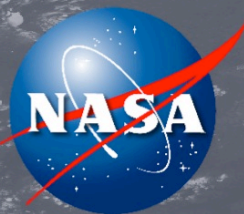




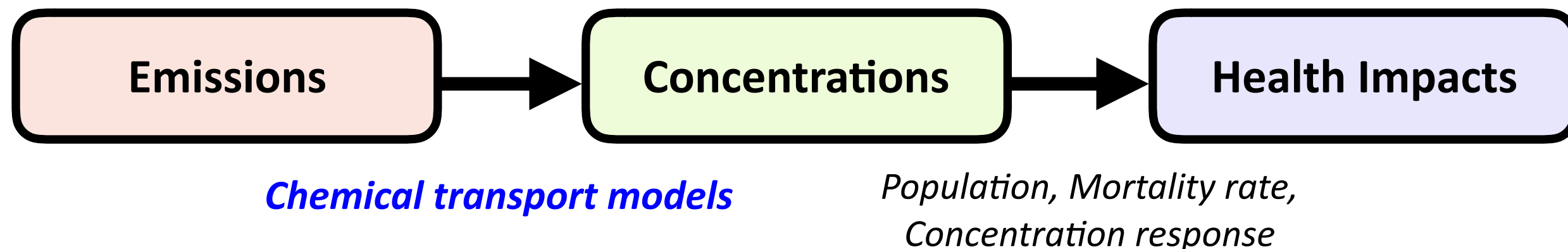
Long-term ozone exposure and mortality



Chemical transport models provide global maps but suffer from systematic errors (Silva et al., 2016; Malley et al., 2017, Zhang et al., 2018). Chang et al. (2019) combined multiple models and TOAR observations, but it is still limited by the observing network

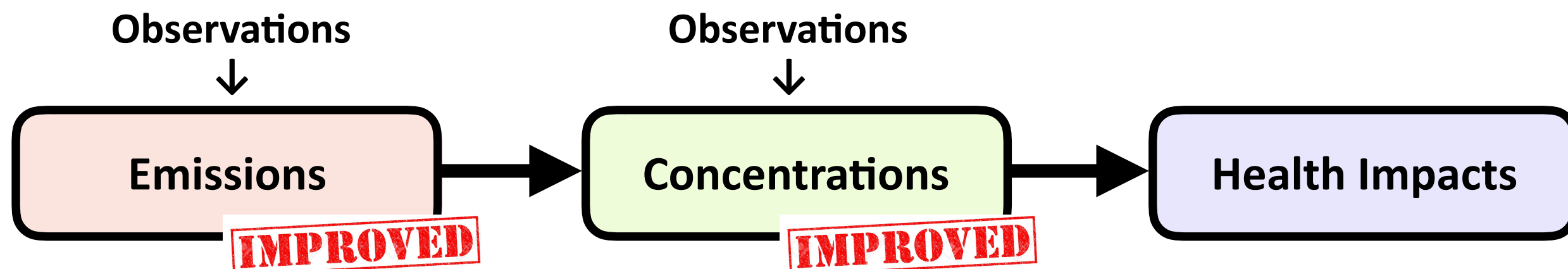


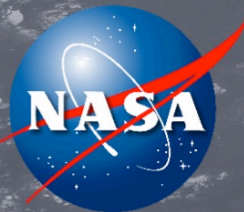
Long-term ozone exposure and mortality



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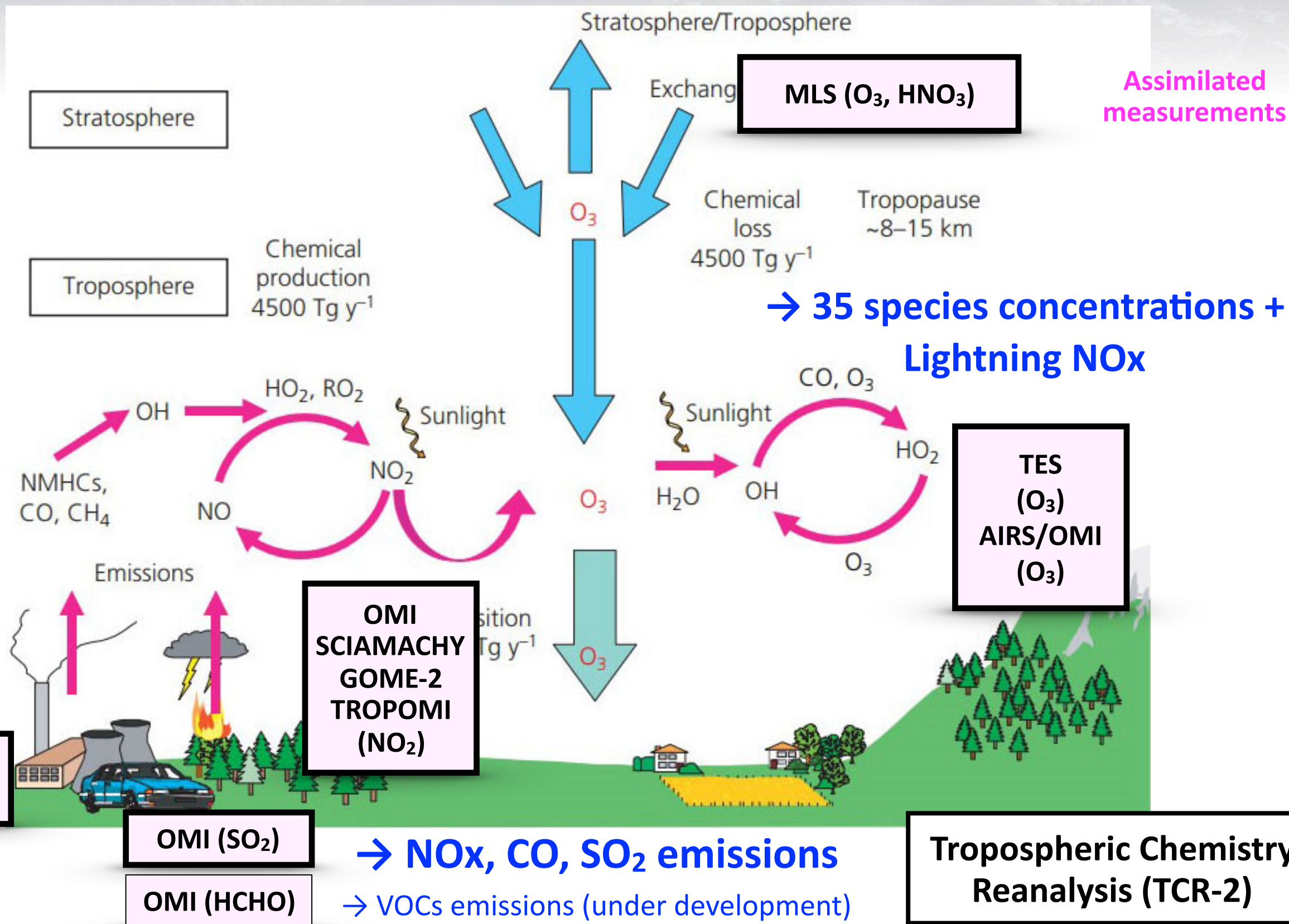
New state-of-the-art chemical data assimilation systems can mitigate these limitations by integrating various observational information with a model

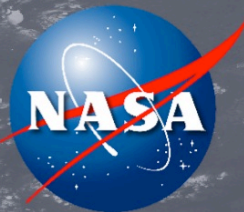




Multi-constituent chemical data assimilation

EnKF data assimilation to integrate a suite of measurements from multiple satellite sensors



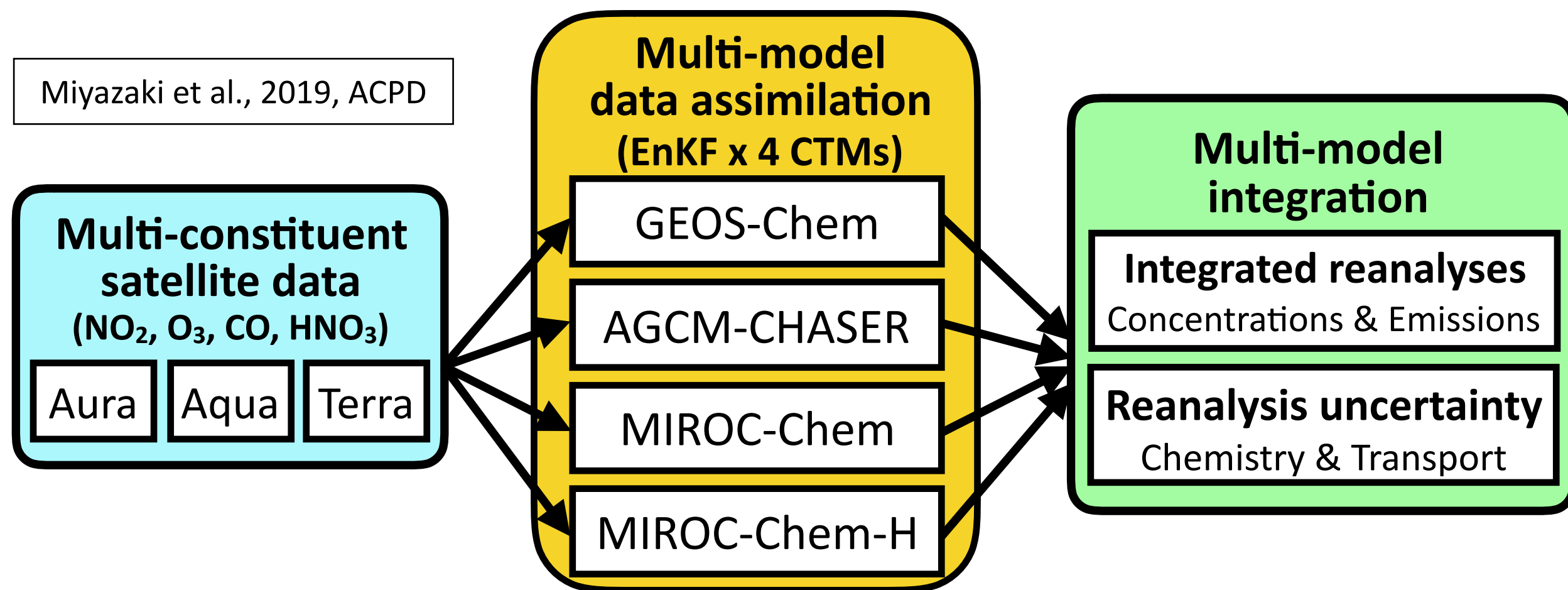


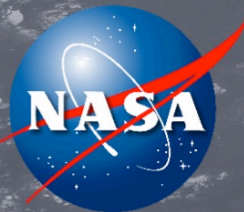
Multi-model data assimilation integration

Chemical reanalyses provide useful information on exposure estimates and its attributions. Nevertheless, **systematic model errors must be quantified in order to assess their fidelity**

Multi-mOdel Multi-cOnstituent CHEMical data assimilation (MOMO-Chem)

Miyazaki et al., 2019, ACPD



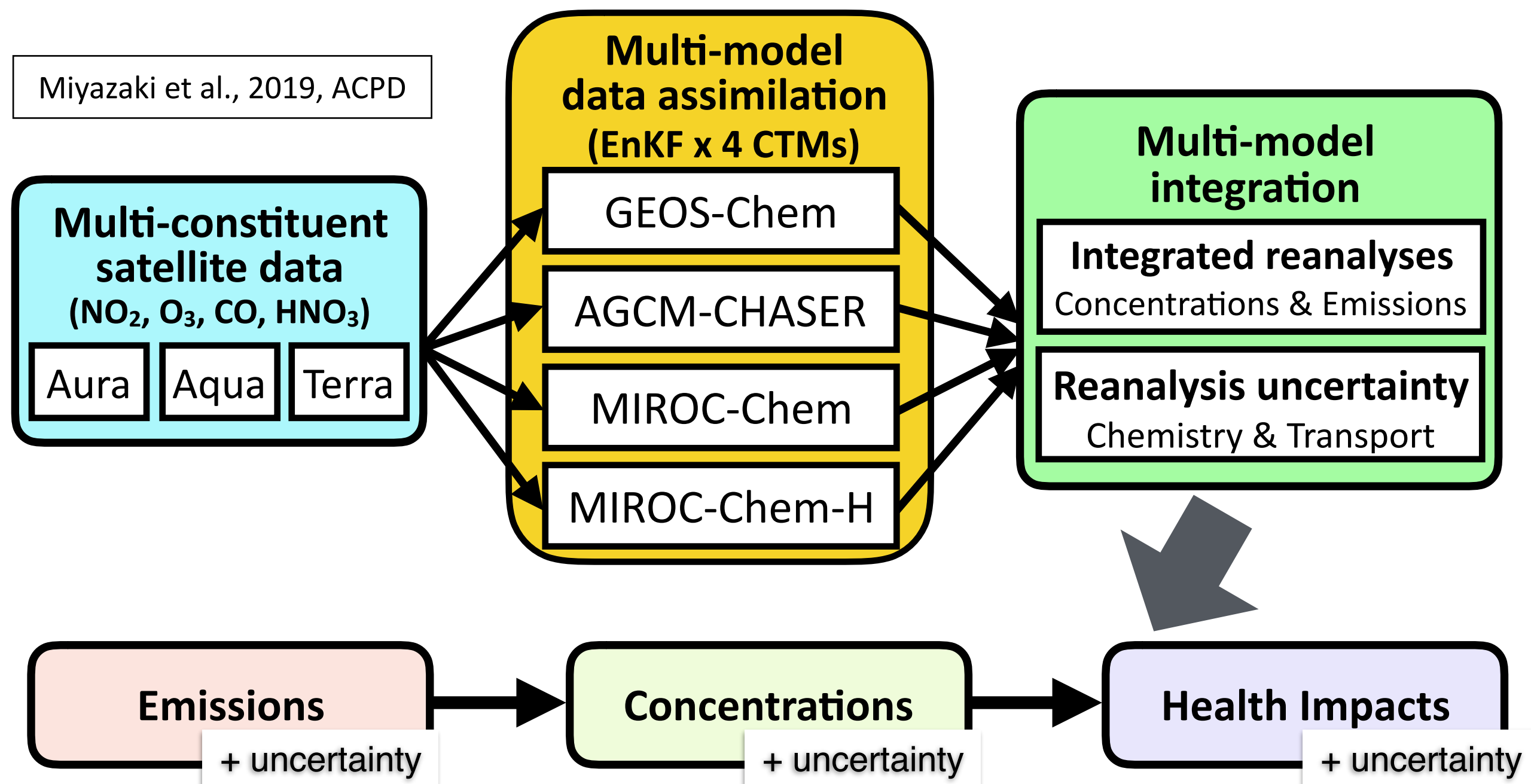


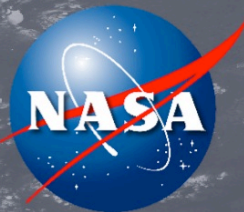
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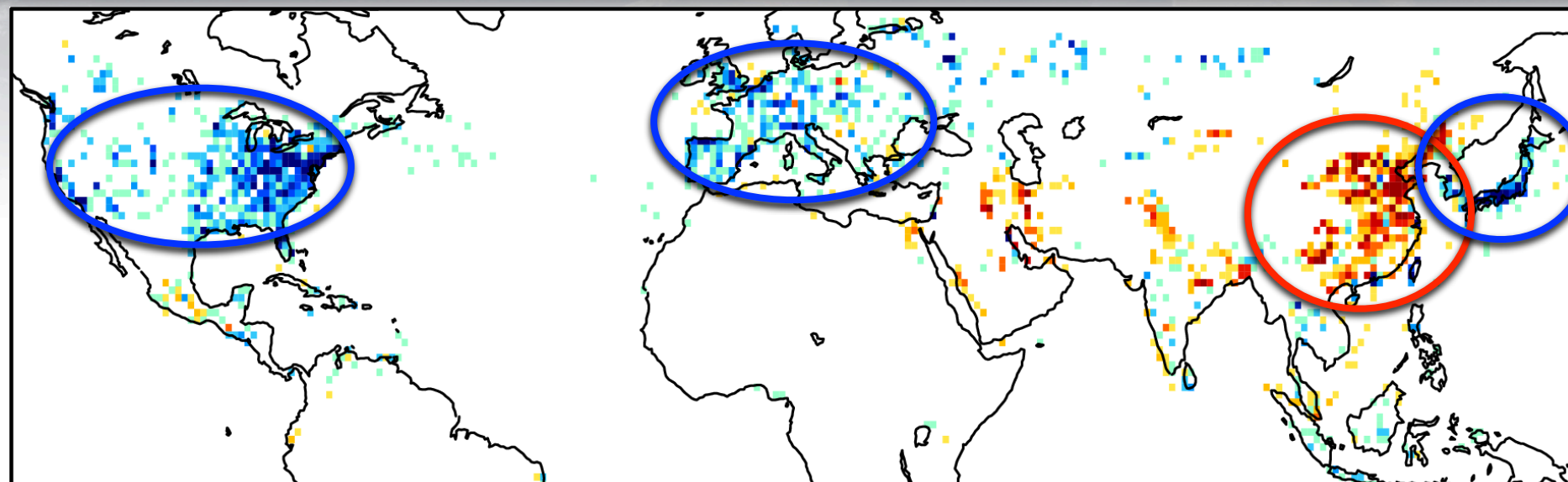
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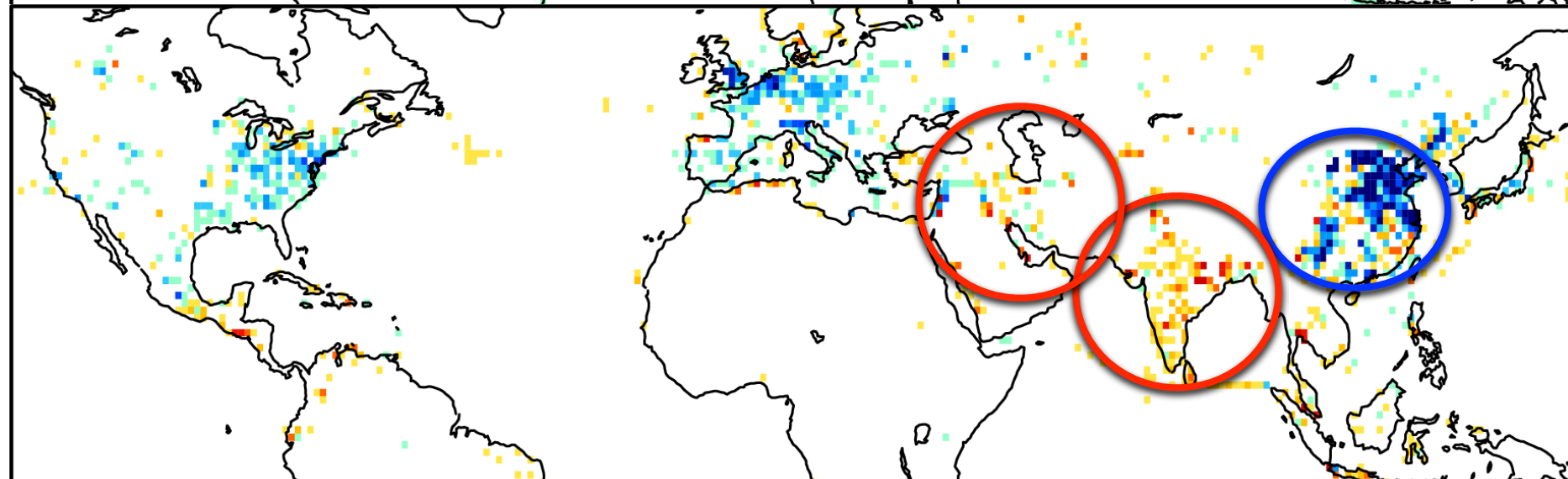




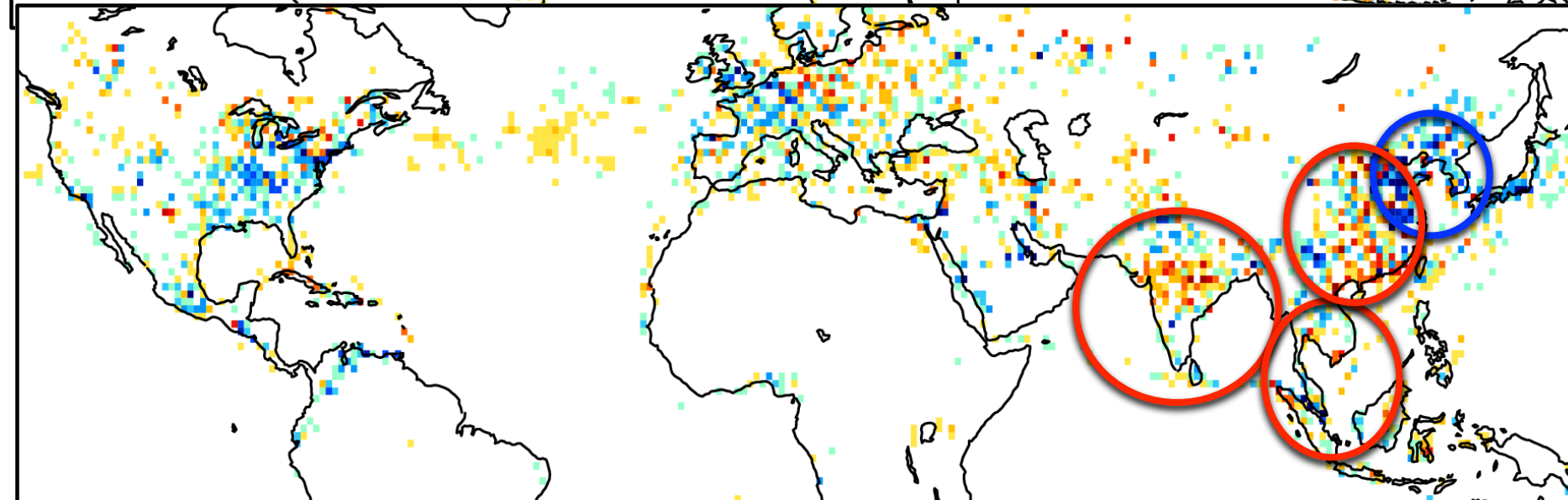
Global NO_x emission trends (2005-2018)



2005-2010

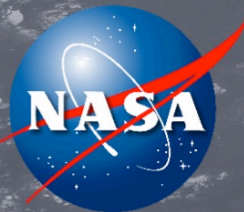


2010-2015

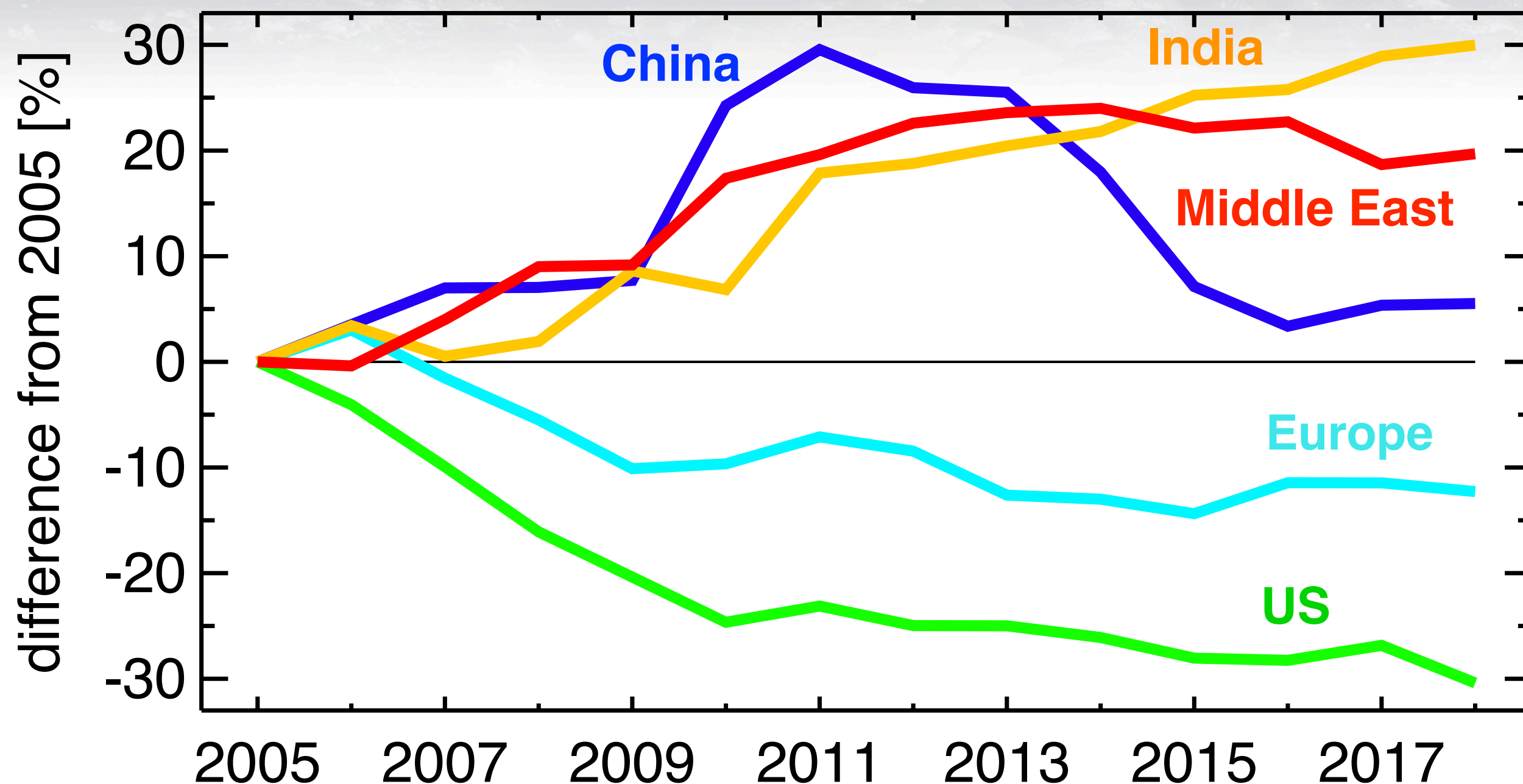


2015-2018

*strong impacts on air
quality and human health
in developing countries*



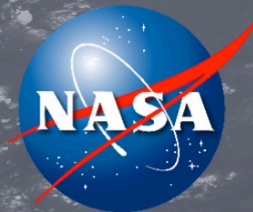
Global NO_x emission trends (2005-2018)



Global total emissions:

Almost constant during 2005-2018 ($49.3 \pm 2.7 \text{TgN}$)

Miyazaki et al.,
to be submitted



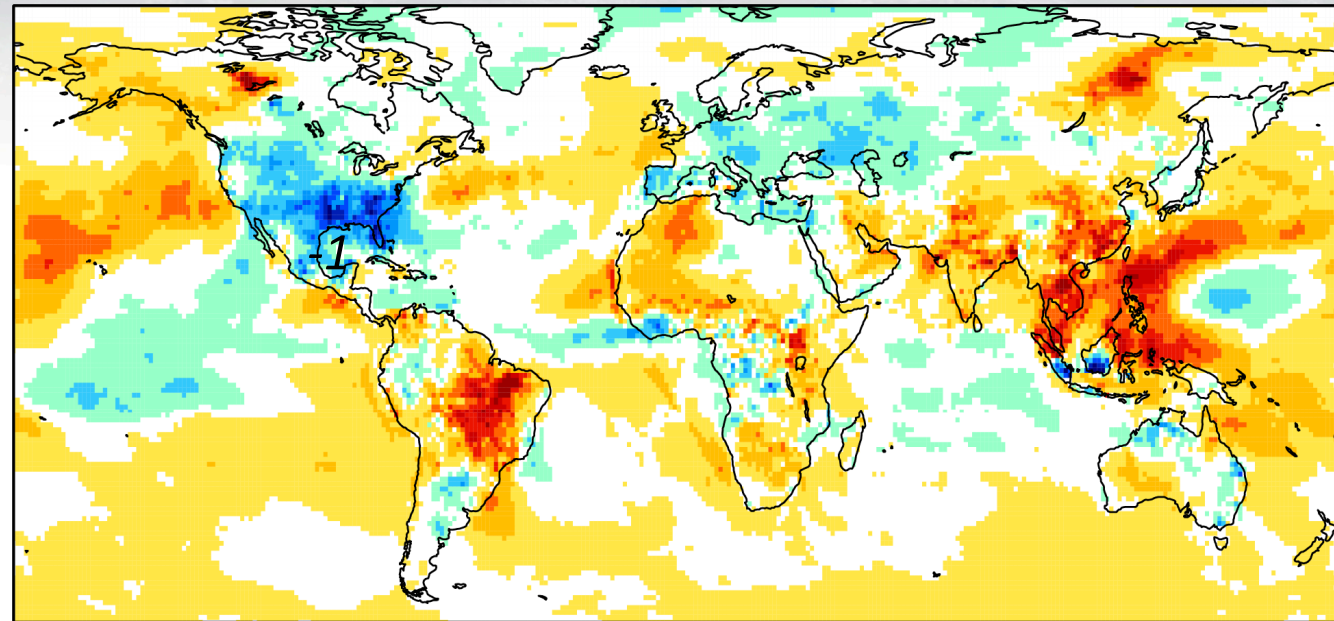
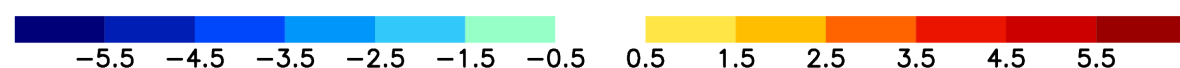
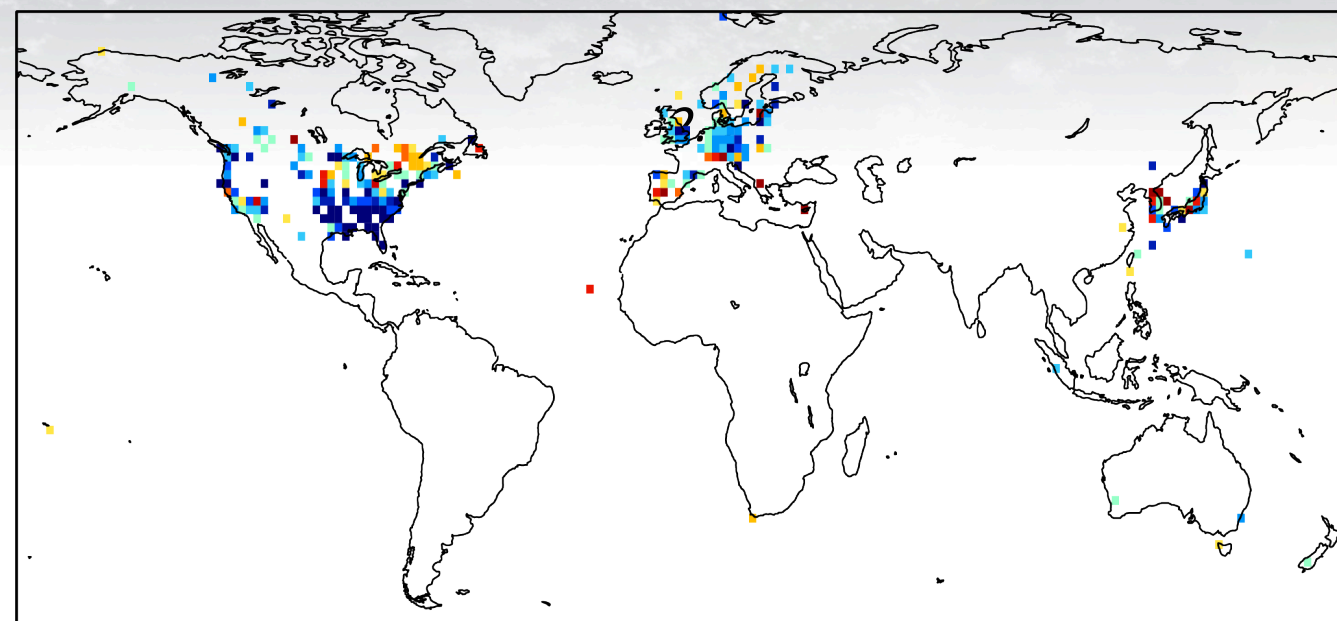
Global surface ozone trends

(Annual average daily maximum 8-h ozone: ADM8h)

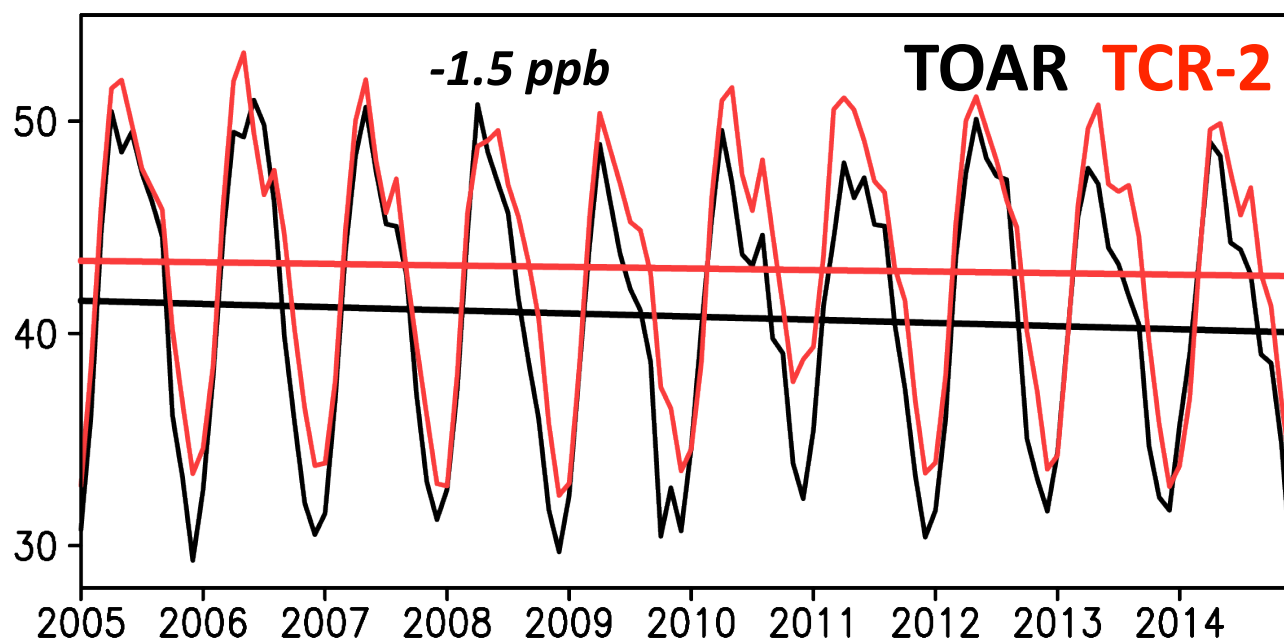
TOAR

2014 minus 2006

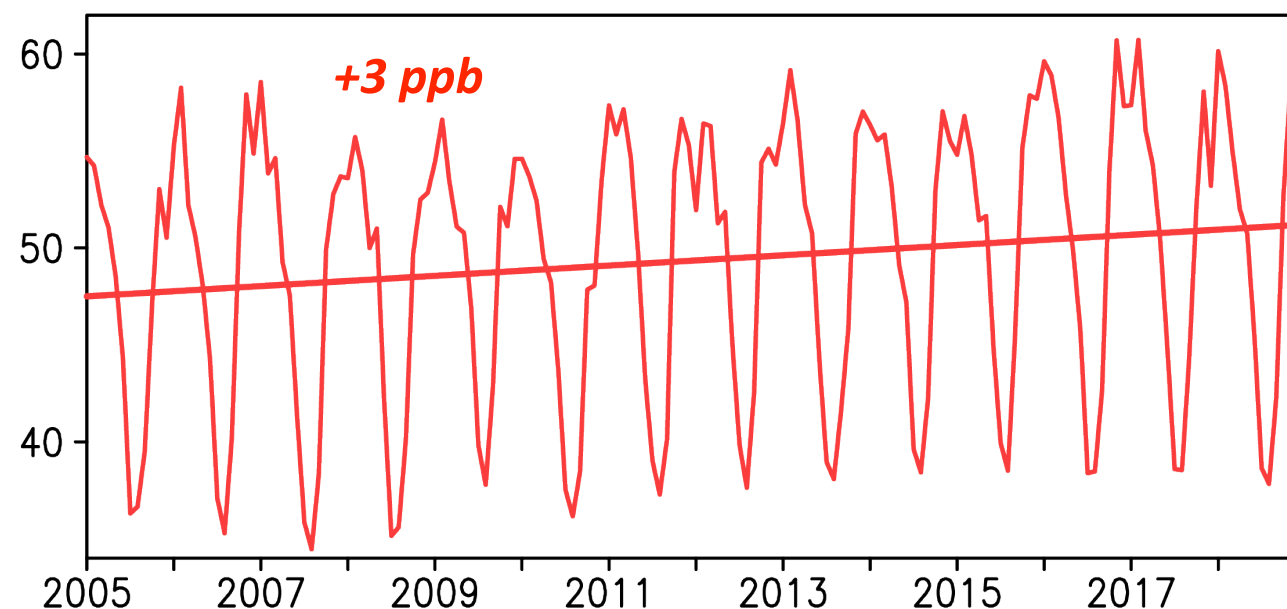
TCR-2



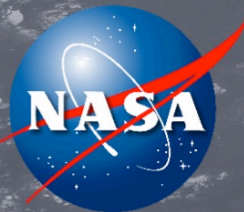
United States



India



Chemical reanalyses provide useful information on exposure estimates and its attributions
(mostly due to NO_x emissions changes over polluted areas)



Change in mortality due to long-term ozone exposure

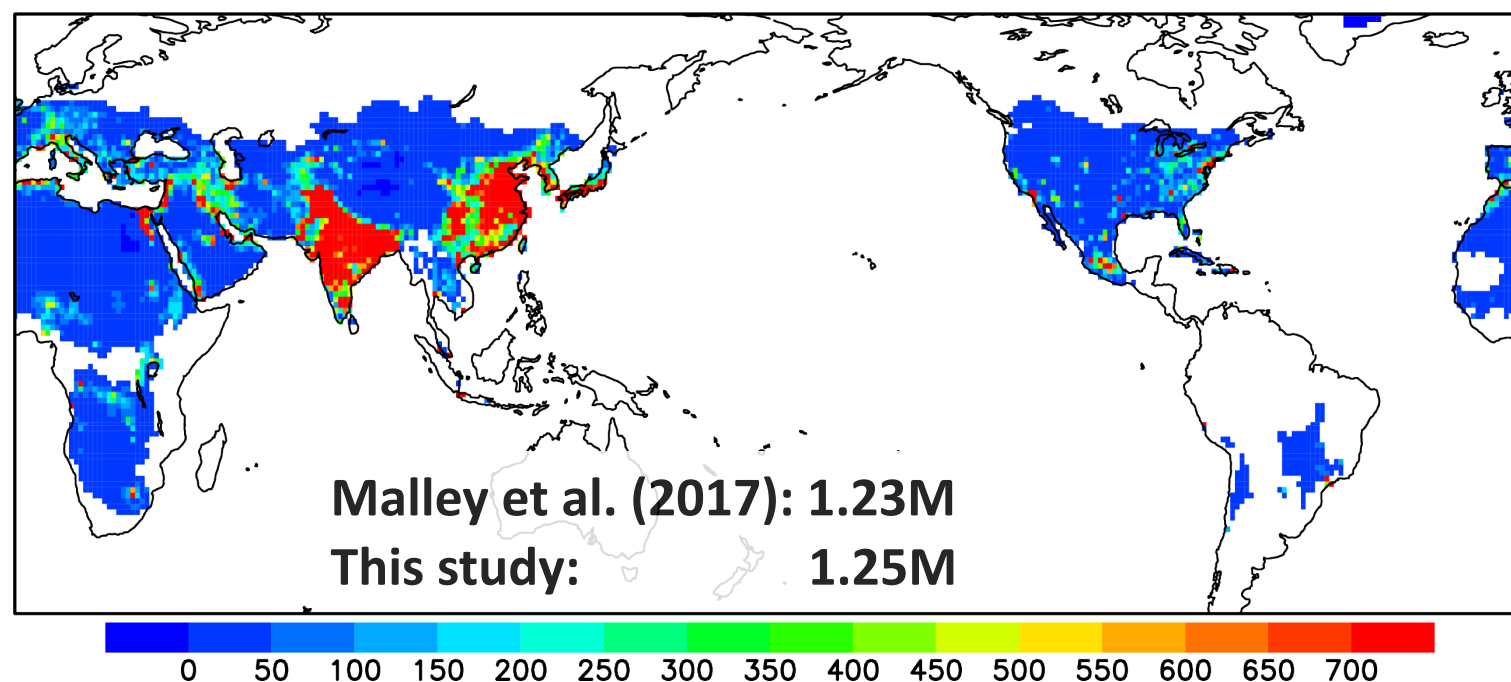
$$\Delta\text{Mort} = y_0(1 - \exp^{-\beta\Delta X})\text{Pop.}$$

$$\text{HR} = \exp^{\beta\Delta Y}$$

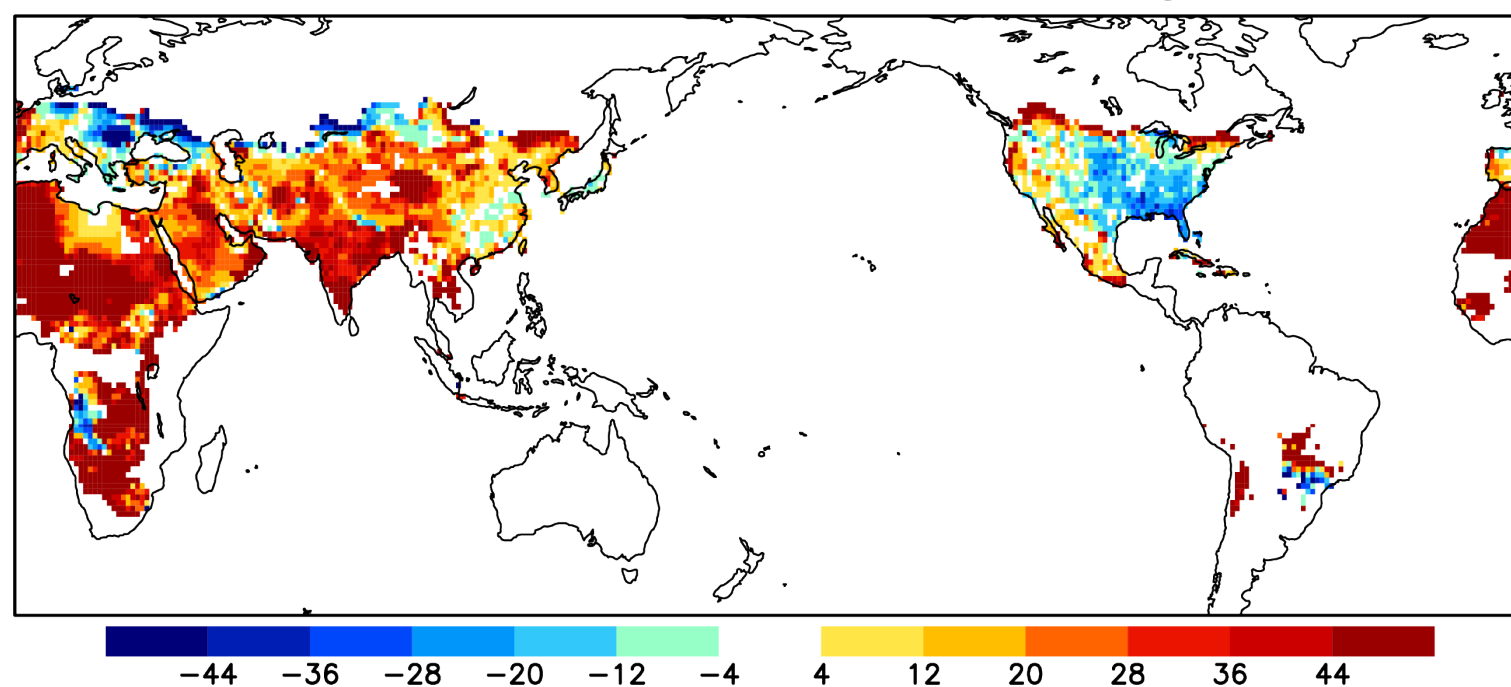
$$\Delta X = \begin{cases} 0, & \text{if } \text{O3_GC} \leq \text{LCC} \\ \text{O3_GC} - \text{LCC}, & \text{if } \text{O3_GC} > \text{LCC} \end{cases}$$

- y_0 : baseline mortality rate (800/100,000)
- Pop : exposed population (GWP v4)
- β : effect estimate (from the hazard ratio: HR)
- HR : 1.12 (Turner et al., 2016)
- LCC : 33.3 ppb

ΔMort in 2016 [number of deaths per 1°x1° grid]



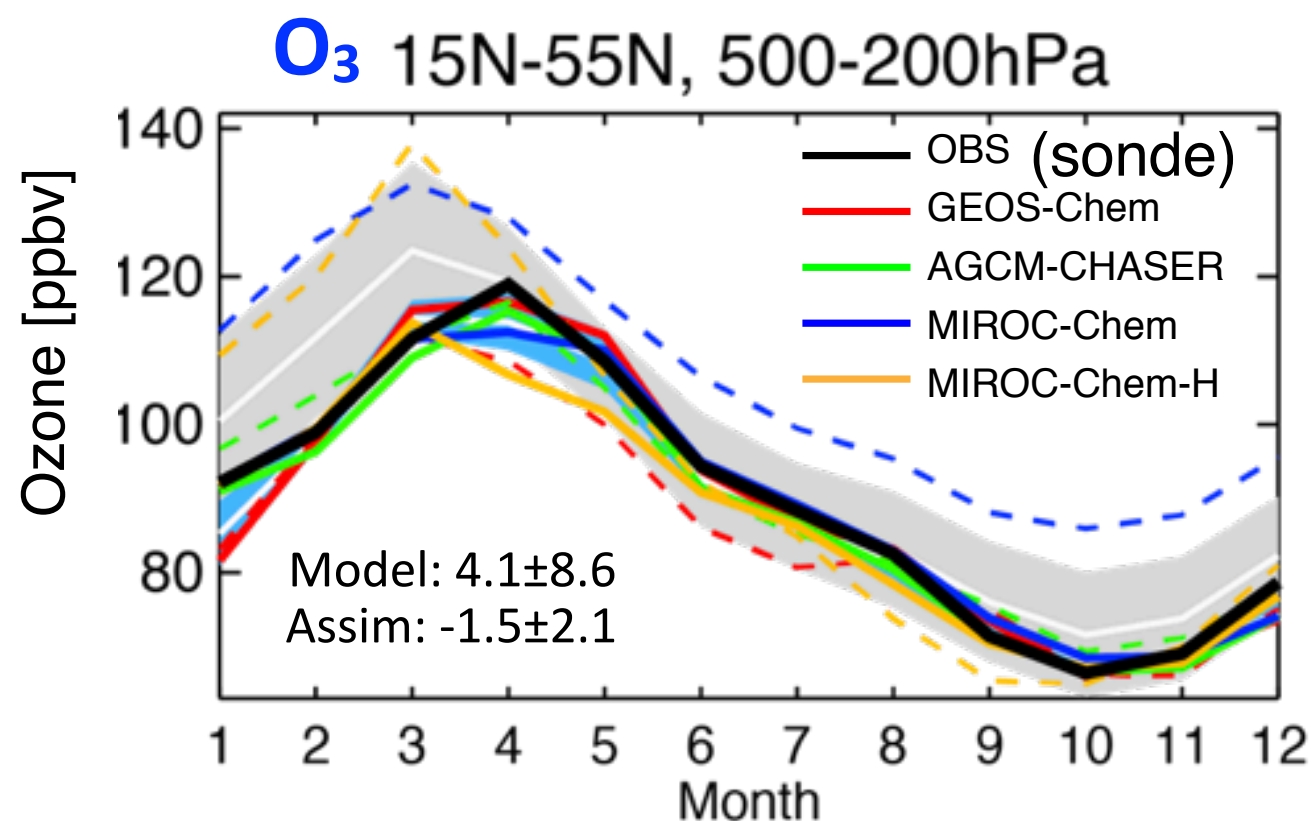
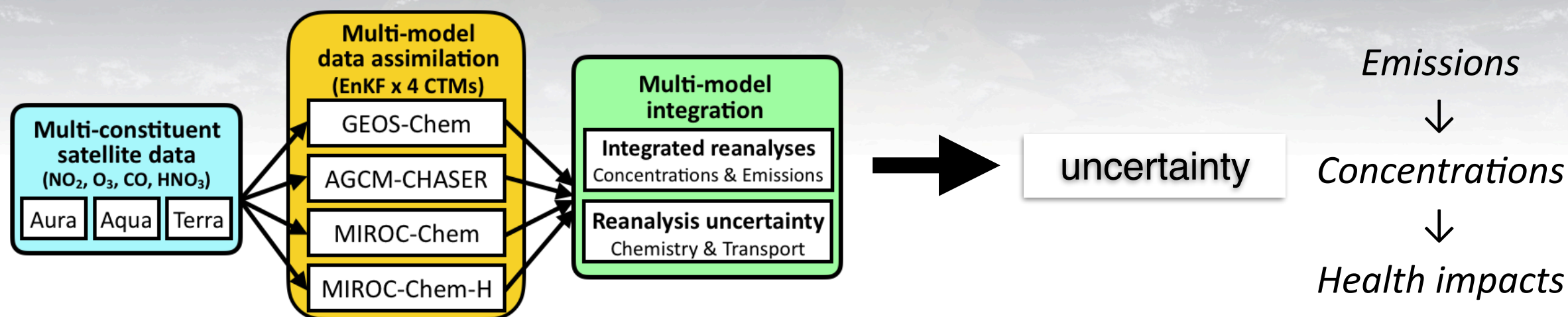
Difference between 2016 and 2005 [%] due to ΔX and Pop changes



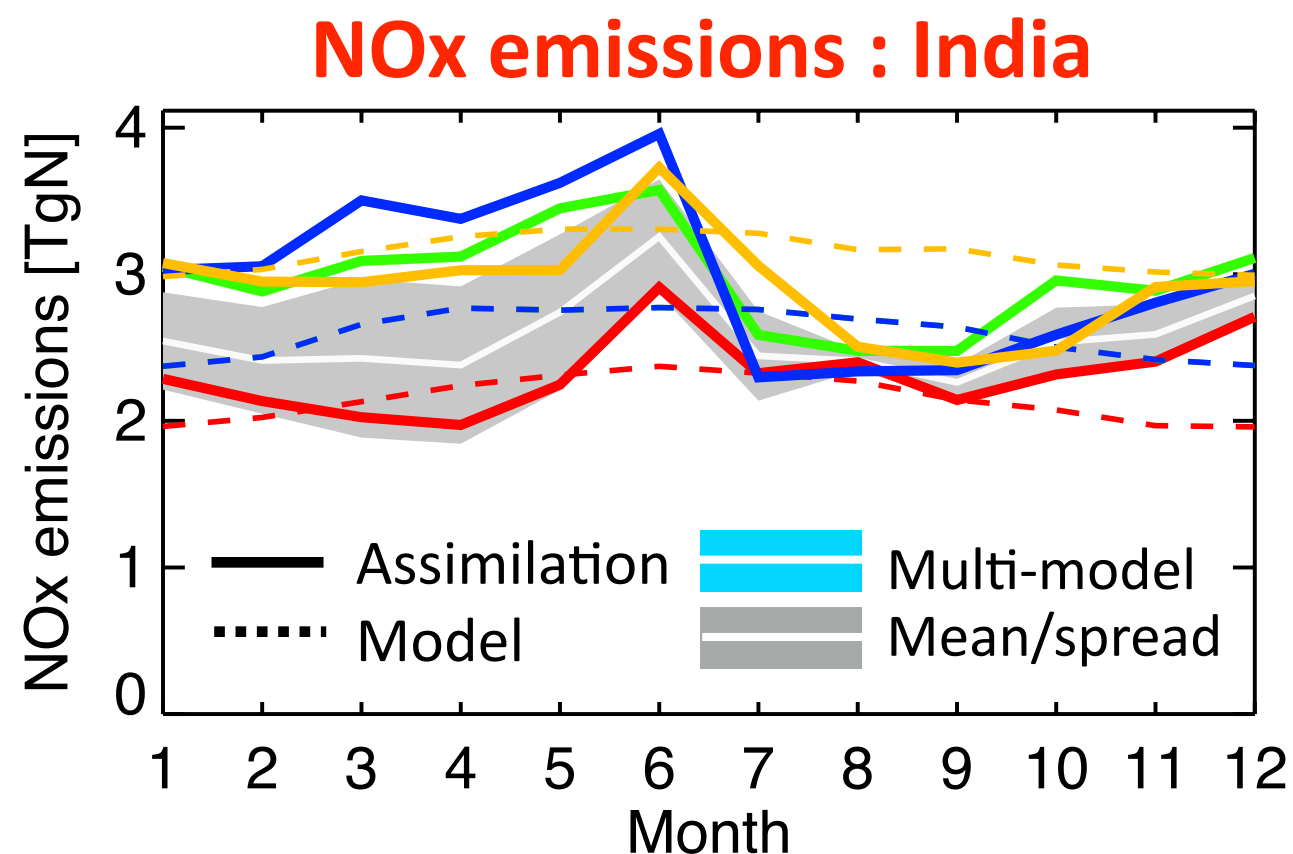
	2005	2016	
Globe	1,002 K	1,248 K	25%↑
US	58 K	54 K	7%↓
E China	256 K	280 K	9%↑
India	286 K	399 K	40%↑



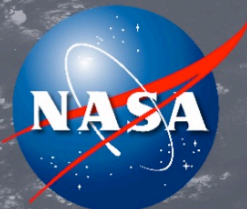
Uncertainty estimates using MOMO-Chem



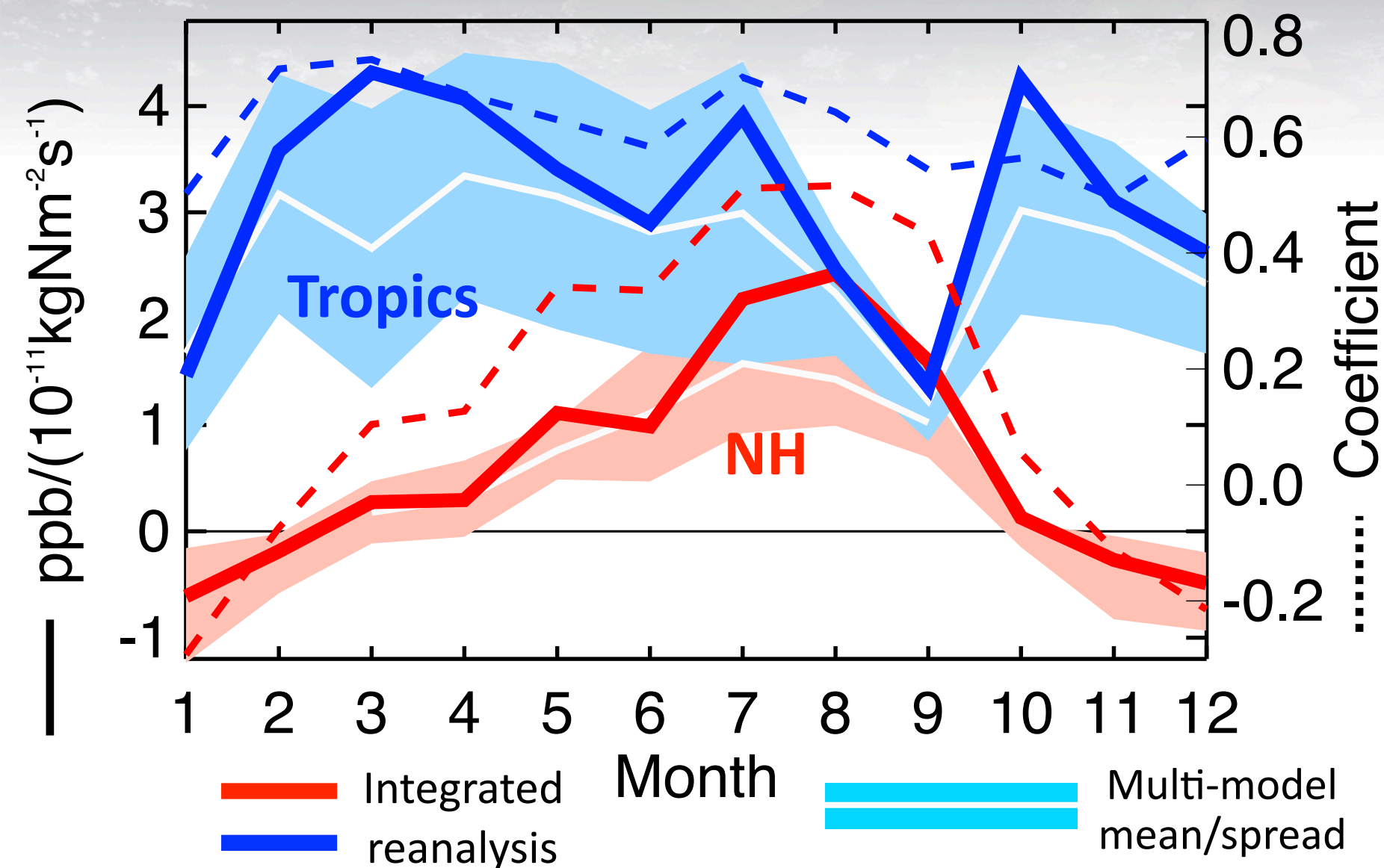
- Harnessing the current observing system provides sufficient constraints to greatly reduce the influences of model errors and to provide the **consistent ozone analysis**



- **Possible uncertainty ranges in the a posteriori emissions** due to model errors: 13–31% for industrialized areas and 4–21% for BB areas.



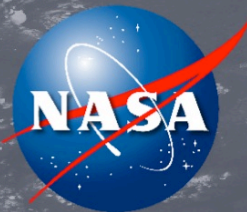
Uncertainty estimates using MOMO-Chem



Surface ozone response to NOx emissions

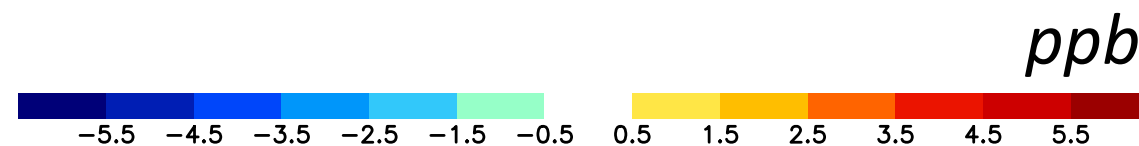
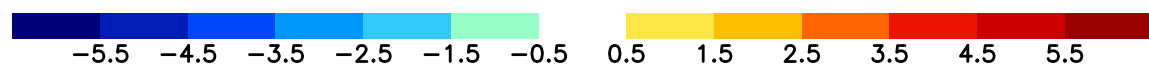
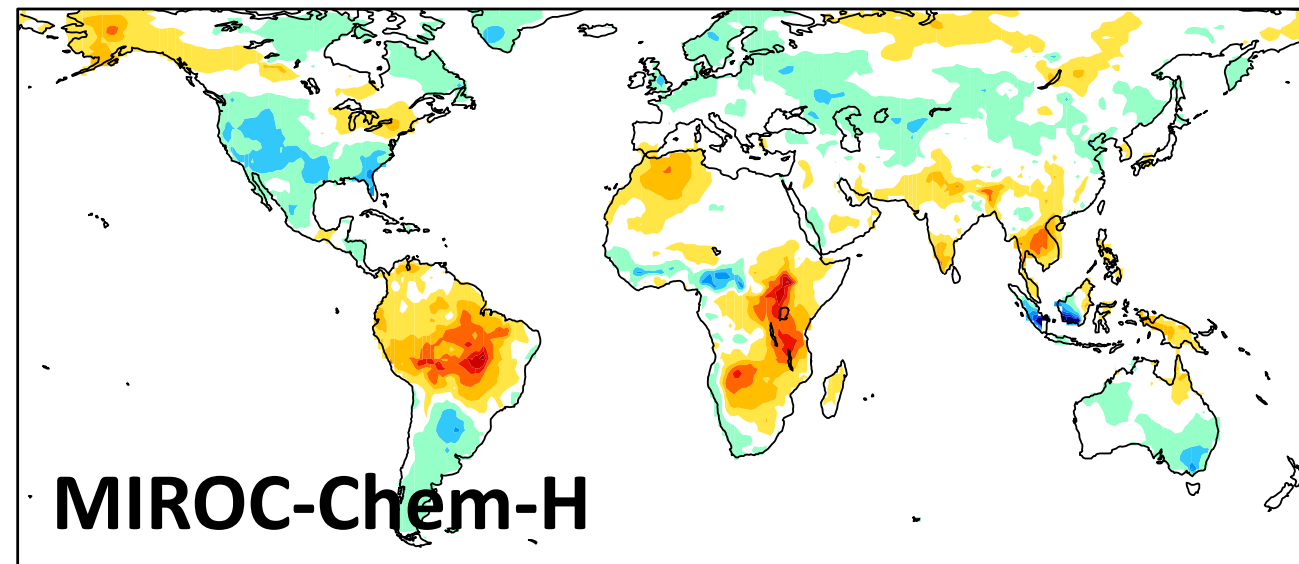
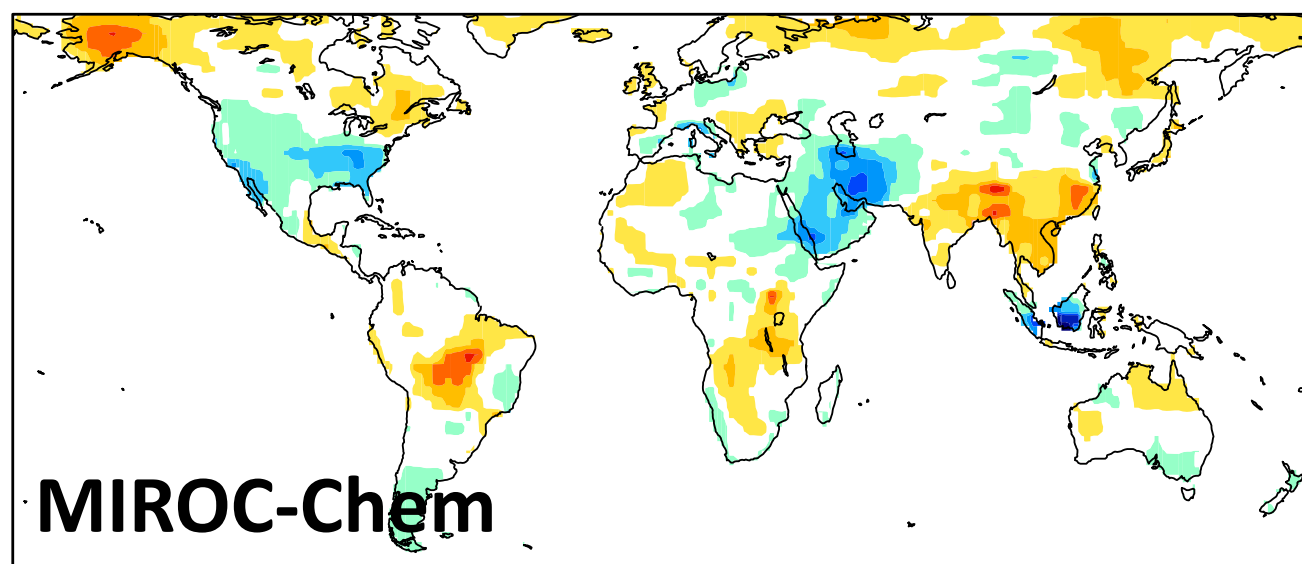
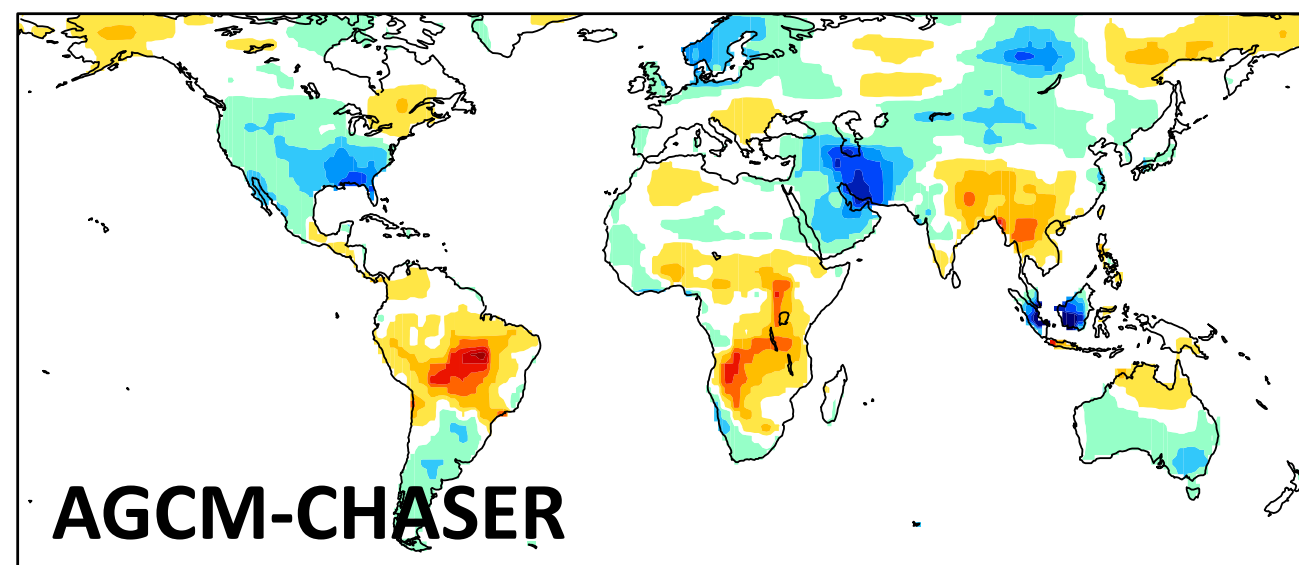
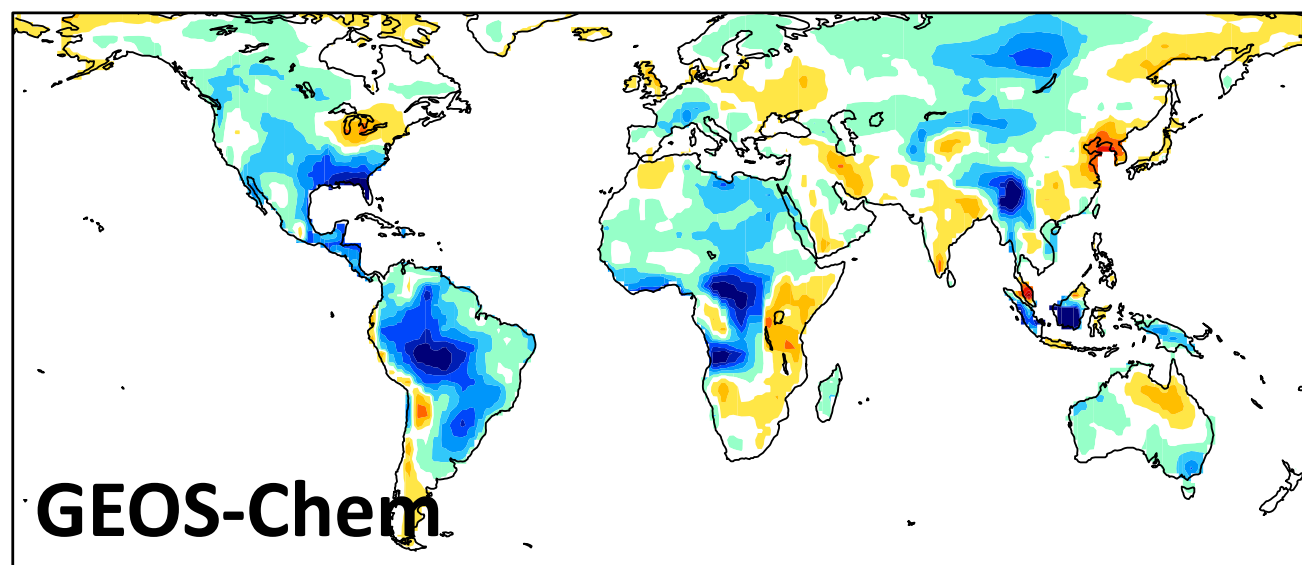
The analysis increments were used to quantify model sensitivities related to chemistry and transport

- **TR > NH** : Latitudinal shifts in NOx emissions would increase global ozone.
- The sensitivity of surface ozone to NOx emissions varied by a factor of 2 among models, which would increase exposure estimate uncertainty.
- The observationally-constrained, multi-model integrated fields provide fundamentally different fast chemical processes than those in the individual models.

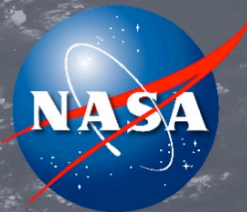


Uncertainty estimates using MOMO-Chem

MDA8 ozone trend (2016 minus 2006) : before assimilation

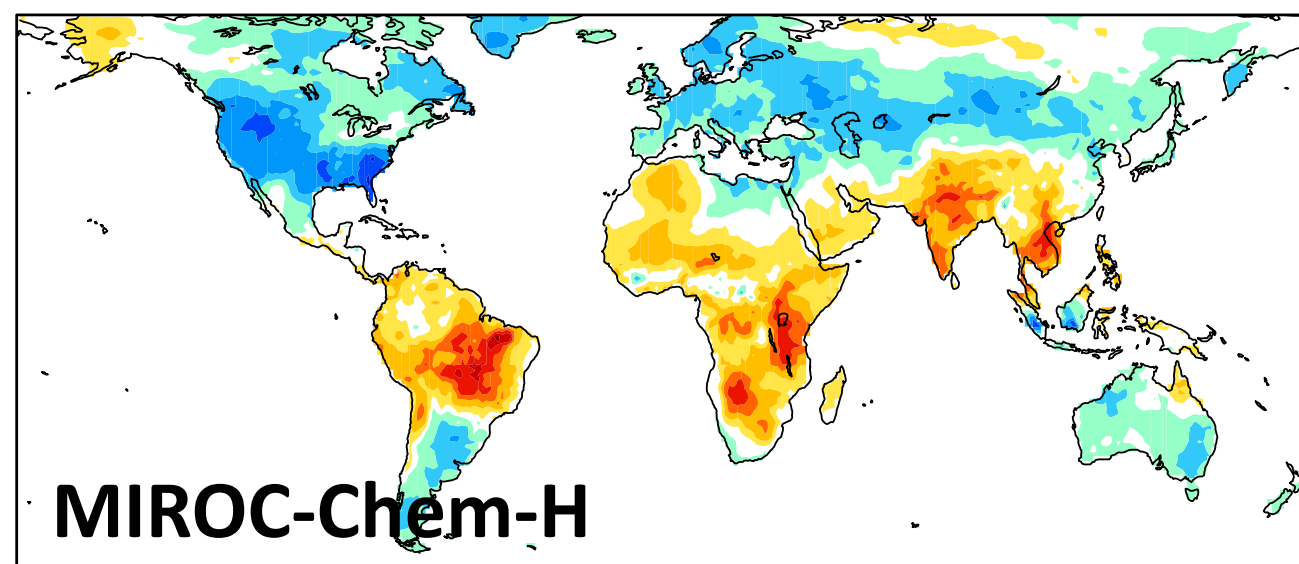
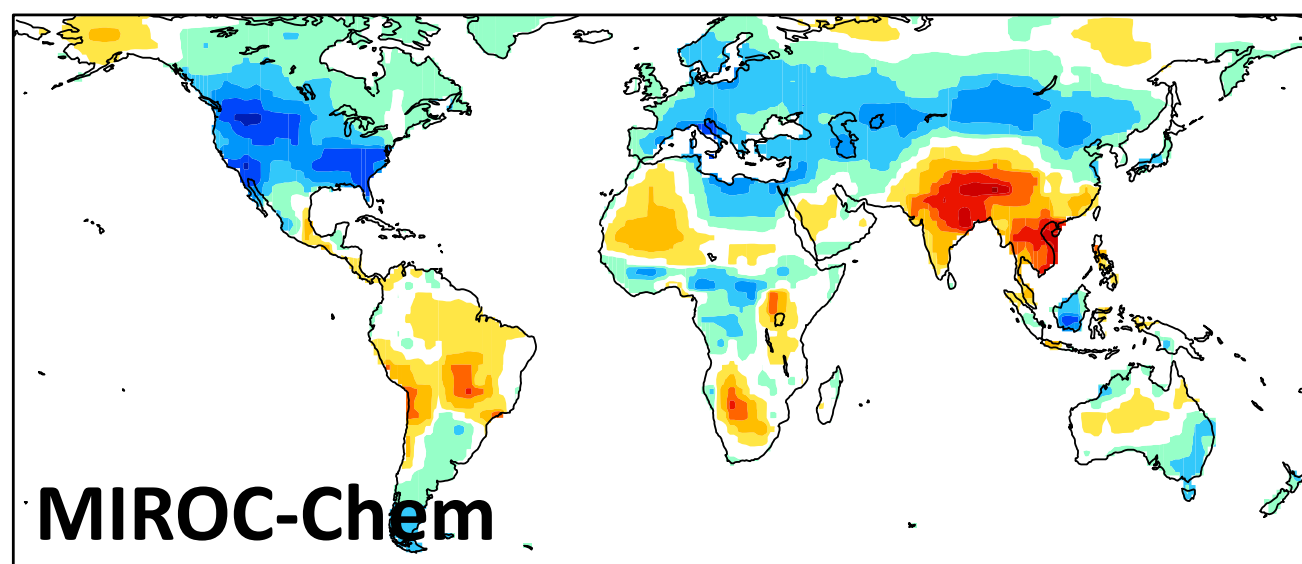
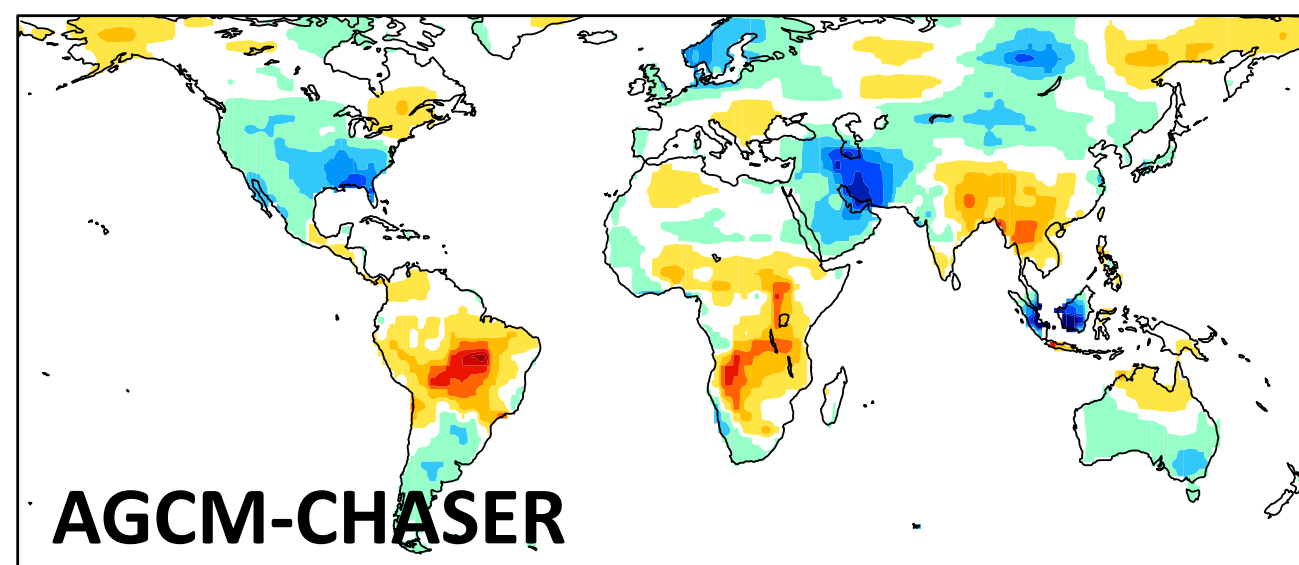
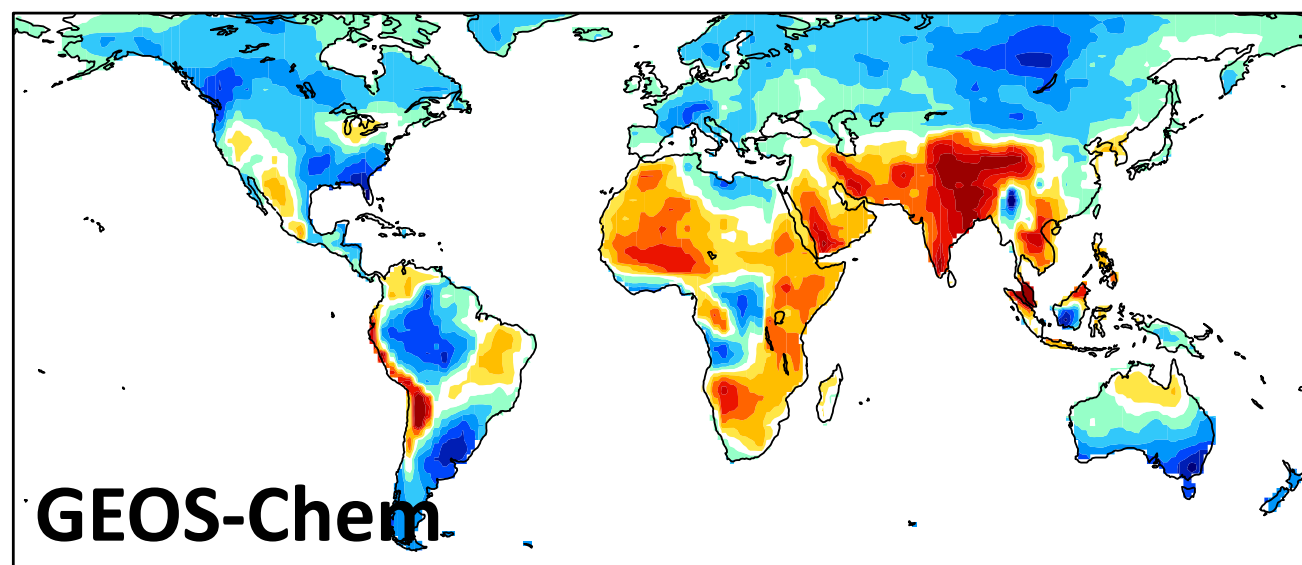


Unrealistic trends & large spreads among the models (2-10 ppb)



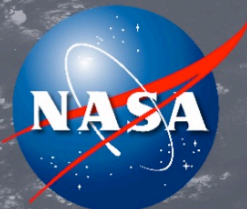
Uncertainty estimates using MOMO-Chem

MDA8 ozone trend (2016 minus 2006) : **after assimilation**



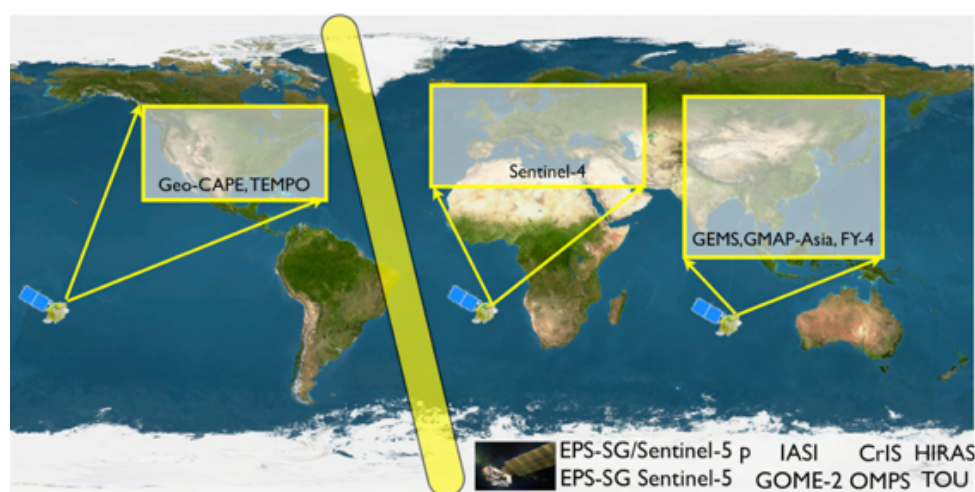
ppb

*Multi-model spreads are reduced to 1-5 ppb
→ up to 30 % mortality uncertainty*

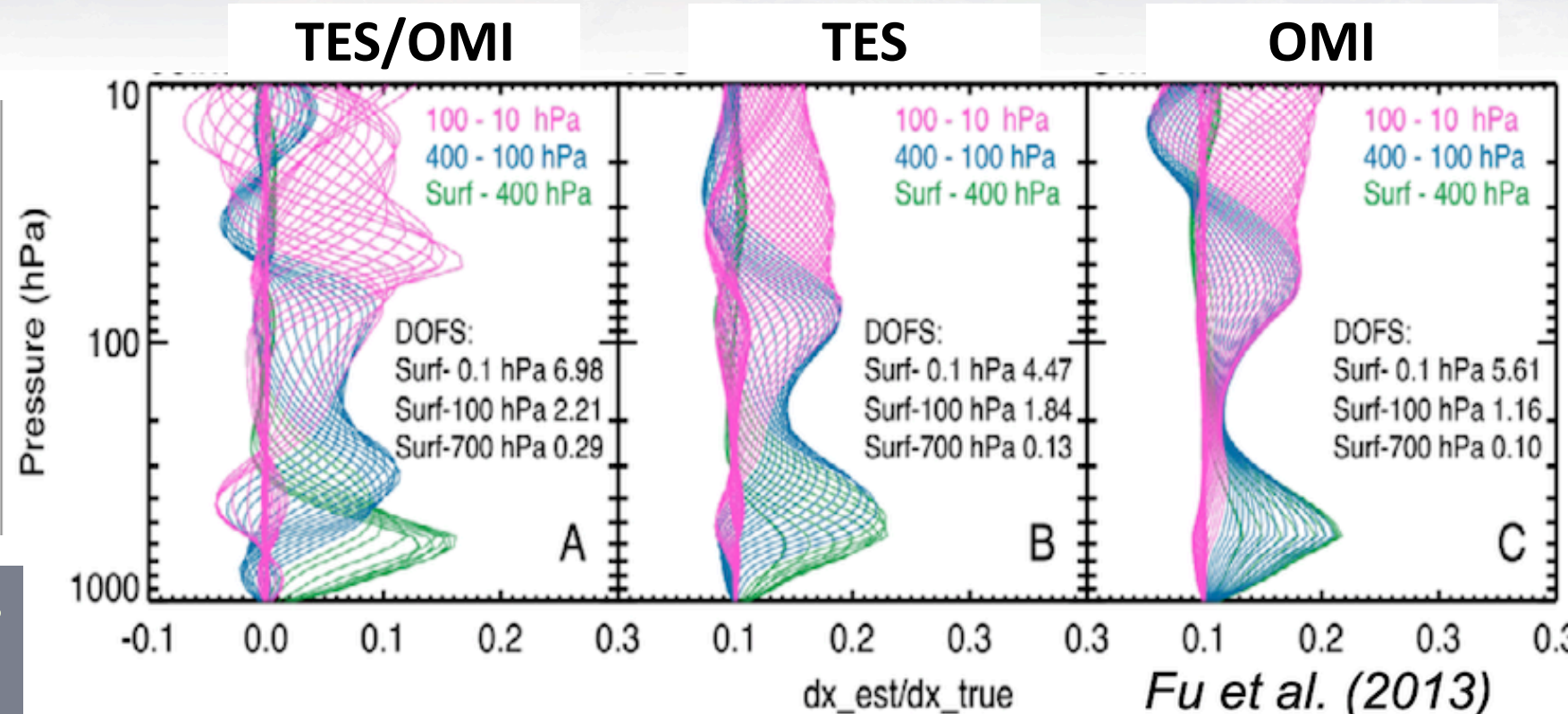


Towards an Air Quality Constellation

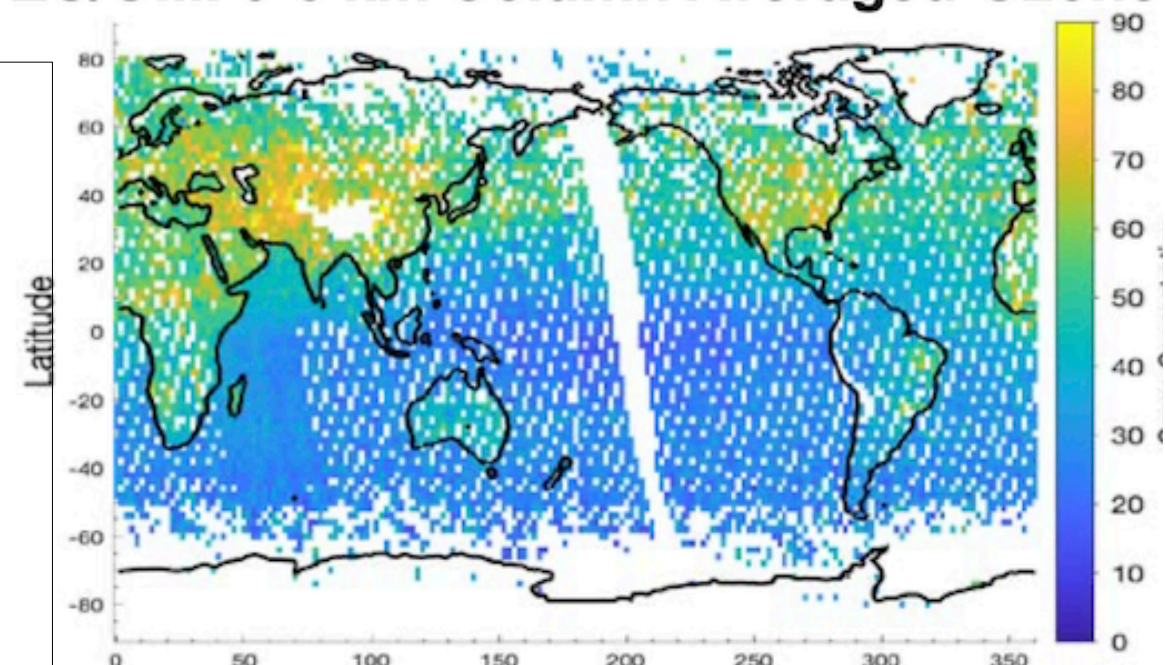
Individual satellite measurements have provided an unparalleled source of global data but suffer from limited surface sensitivity for many key species



*TES/OMI to infer global surface ozone
A53T-2932 poster by Nadia Colombi
(Friday afternoon)*

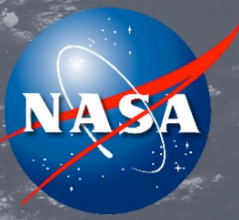


TES/OMI 0-3 km Column Averaged Ozone



How does the constellation improve health impact assessment?

- GEO sounders will provide an unprecedented number of composition observations at high resolution.
- LEO sounders (IASI, CrIS, S5p) provide the global picture and thread the GEO observations together.
- Multispectral retrievals provide improved vertical sensitivity.



Conclusions

- While the most recent reanalysis products (e.g., TCR-2 & CAMS) agree well each other, the discrepancy increased towards the surface due to differing chemical model, assimilation approaches, and observing system.
- The sensitivity of surface ozone to NO_x emissions varied by a factor of 2 among models, which would increase the inter-reanalysis discrepancy and exposure estimate uncertainty.
- The multi-constituent and multi-model data assimilation framework provides observationally-constrained estimates of global air quality exposure (1.00M for 2005 and 1.25M for 2016) and its uncertainty (up to 30 %) for the past decade.
- Assimilating datasets from a new constellation of LEO sounders, GEO satellites, and multispectral retrievals would further enhance the potential of chemical reanalysis for observationally constrained global health impact assessment